



## $\bar{\nu}_{\mu} CC\pi^0$ in NOvA:

Status of Muon Antineutrino Charged-Current Neutral Pion Production Differential Cross Section Measurement in the NOvA Near Detector

Fan Gao

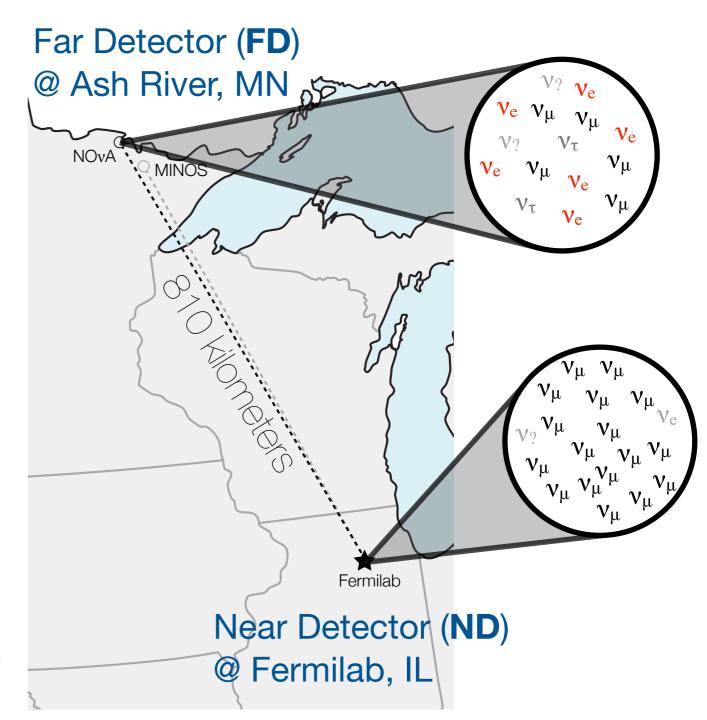
University of Pittsburgh on behalf of the NOvA Collaboration

NuFact 2022 (Salt Lake City, Utah) August 5, 2022

## **NOvA Experiment**

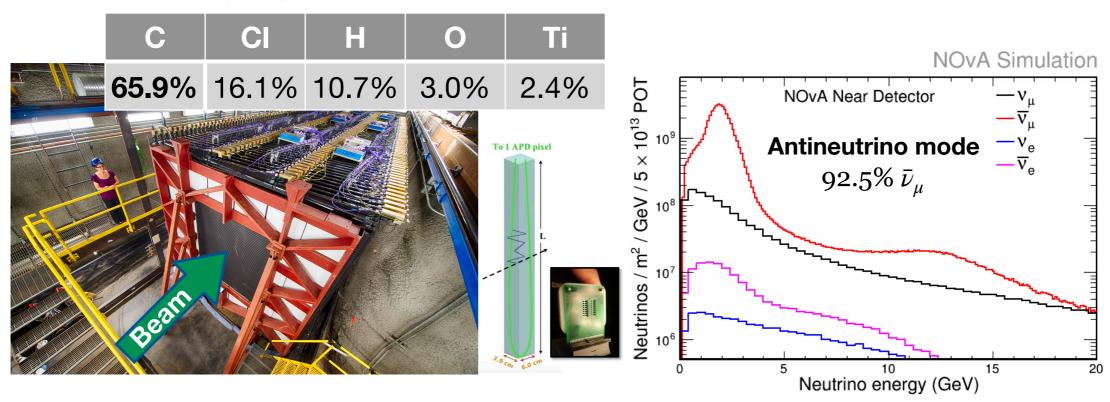
- NOvA is a long-baseline neutrino oscillation experiment
- NuMI beam at Fermilab
  - Neutrino mode  $(\nu_{\mu})$  and antineutrino mode  $(\bar{\nu}_{\mu})$
- Two functionally-identical tracking calorimeter detectors
  - Liquid scintillator
  - Off-axis by 14.6 mrad
  - Separated by ~810 km
- Measure oscillations through 4 channels:

$$\nu_{\mu} \rightarrow \nu_{\mu} \,, \nu_{\mu} \rightarrow \nu_{e} \,, \bar{\nu}_{\mu} \rightarrow \bar{\nu}_{\mu} \,, \bar{\nu}_{\mu} \rightarrow \bar{\nu}_{e}$$



## $\bar{\nu}_{\mu}$ CC $\pi^{0}$ @ NOvA near detector (ND)

- NOvA near detector (ND):
  - Tracking calorimeter made of PVC cells filled with liquid scintillator oil and a loop of wavelength-shifting fiber connected to avalanche photo-diode (APD).
  - Narrow band neutrino beam 1-3 GeV peaks at ~2 GeV.
  - High flux purity (92.5%  $\bar{\nu}_{\mu}$ ) and huge statistics (~1 million  $\bar{\nu}_{\mu}$ CC interactions) in antineutrino mode.

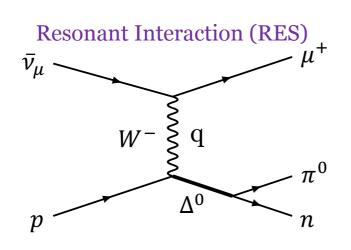


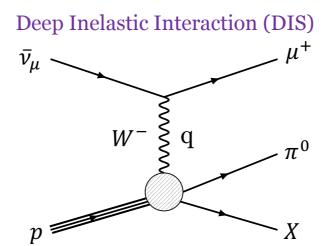
• Goal of this measurement:

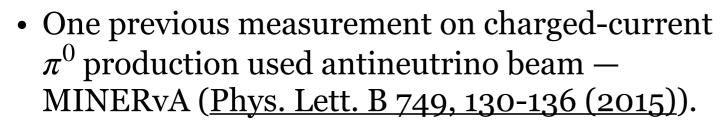
Measure charged-current differential cross section with respect to  $\pi^0$  momentum and angle in the NOvA near detector with muon **antineutrino** beam.

#### **Motivation**

- Neutrino oscillations are measured as function of neutrino energy and accurate estimation of  $E_{\nu}$  requires knowledge of final states.
- $\bar{\nu}_{\mu}$ CC $\pi^{0}$  provides insight on background to  $\nu_{e}/\bar{\nu}_{e}$  appearance.
- Knowledge of  $\bar{\nu}_{\mu} CC\pi^0$  production constrains systematic uncertainties for neutrino interaction models.



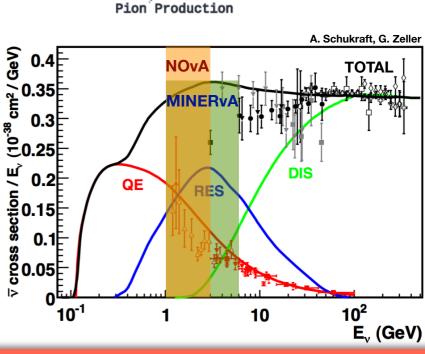




#### $\bar{\nu}_u$ mode

NOvA compared to MINERvA

- ~ 6x POT
- ~ 10x selected signal



**Elastic** 

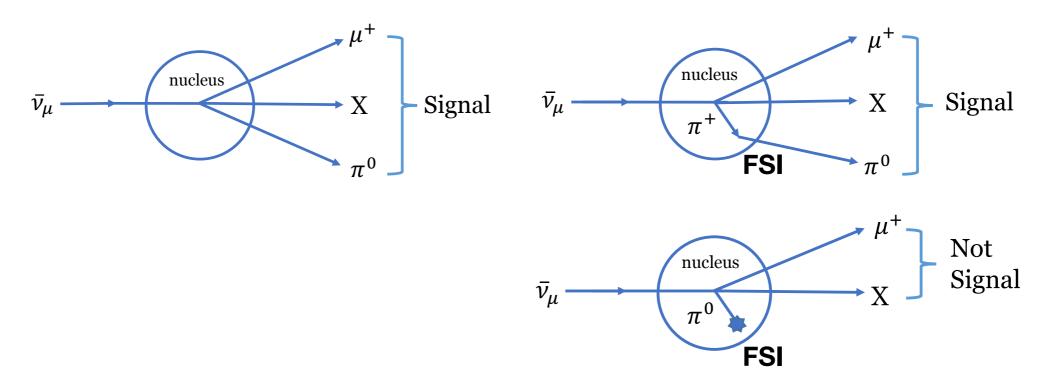
Scattering

**Absorption** 

## **Signal Definition**

$$\bar{\nu}_{\mu} + N \rightarrow \mu^+ + \pi^0 + X$$

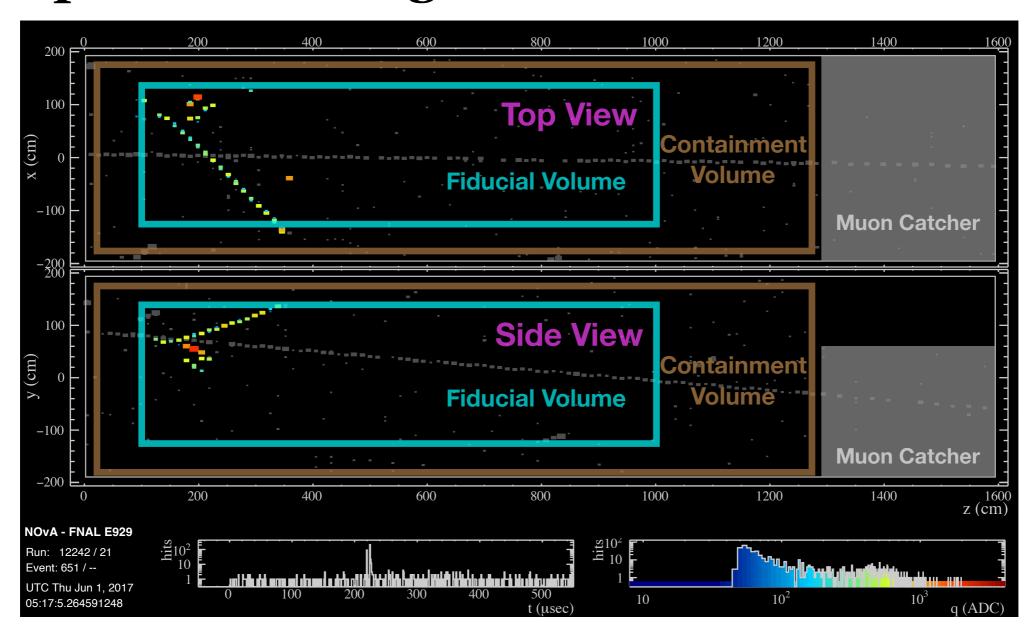
- 1.  $\bar{\nu}_{\mu}$ CC interaction in fiducial volume
- 2. At least one  $\pi^0$  in the final state produced at the vertex
  - including  $\pi^0$  produced in final state interactions (FSI) within the target nucleus.



**Secondary**  $\pi^0$ :  $\pi^0$  produced outside the target nucleus is **background**.

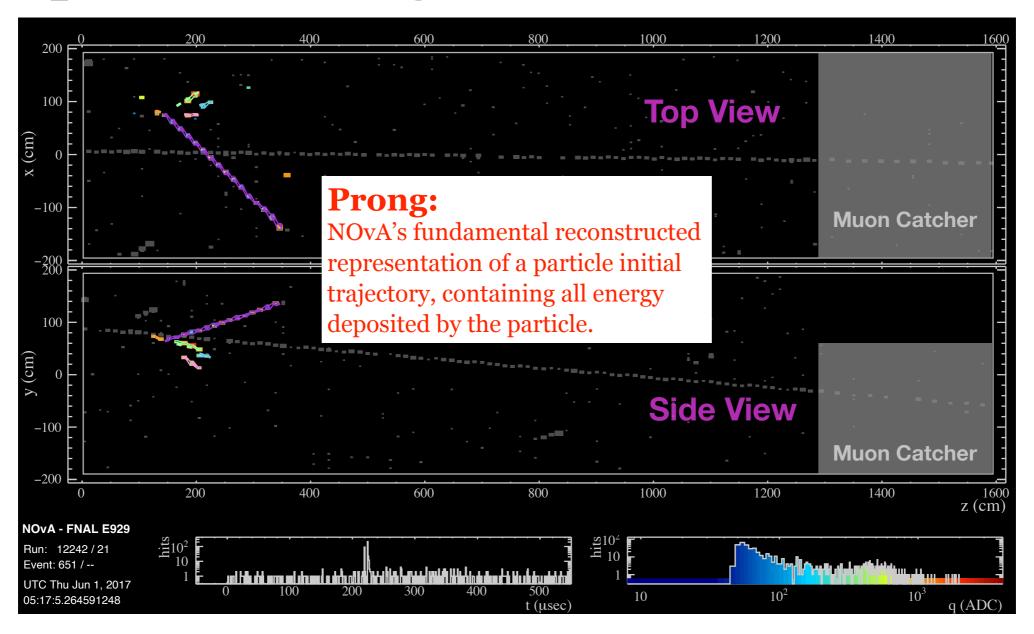
- Particle decay or inelastic scattering during particle propagation

## Sample Selected Signal Event



- 1. Reconstructed interaction vertex is inside the fiducial volume.
- 2. Tracks/Showers are contained.
- 3.  $\bar{\nu}_{\mu}$ CC interaction A long muon track.
- 4.  $\pi^0$  in the final state Two distinct electromagnetic showers  $(\pi_0 \to \gamma + \gamma)$ .

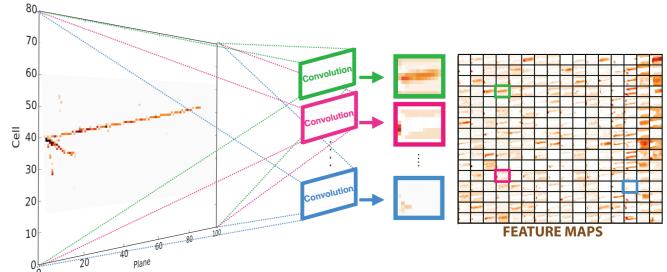
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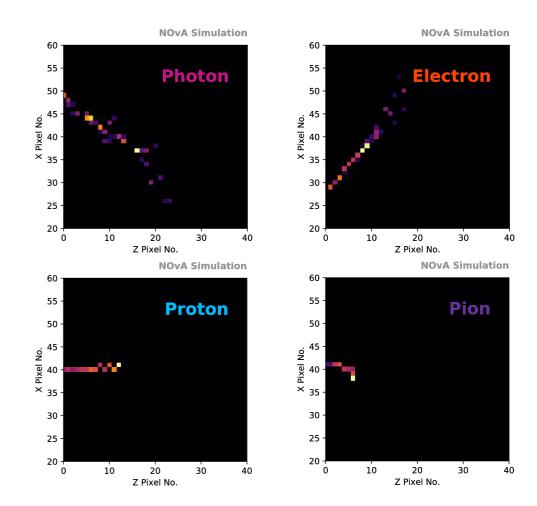
## **NOvA Event/Particle Identification**

- Event and particle identification is done using a Convolutional Neural Network (CNN) in NOvA.
  - Convolutions are applied to **pixel maps** of the events and particles, which are trained to identify particular features (tracks vertex, showers, etc).



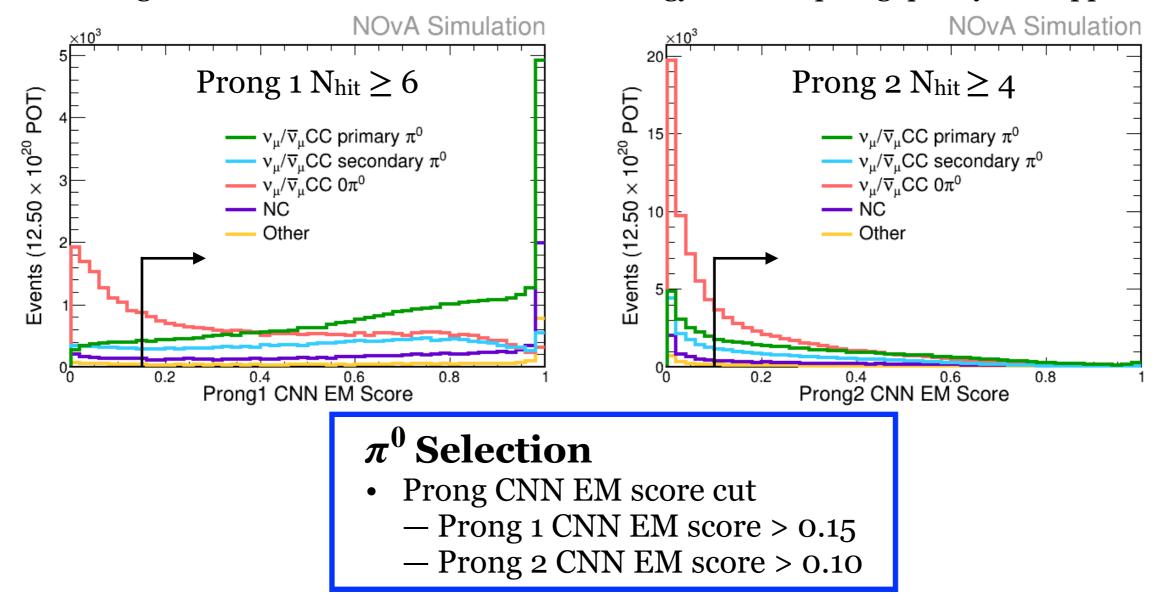
Pixel map for simulated  $\nu_{\mu}$ CC event.

- Single particle simulation sample was chosen for training.
  - $-e, \gamma, \pi^{\pm}, p, \mu$
  - Uniform in momentum, angle, generated position.
- **Binary classification** for prongs: EM-like vs. non-EM-like
  - Equal fraction of EM sample and non-EM sample  $(\gamma + e)$  vs.  $(p + \pi^{\pm})$



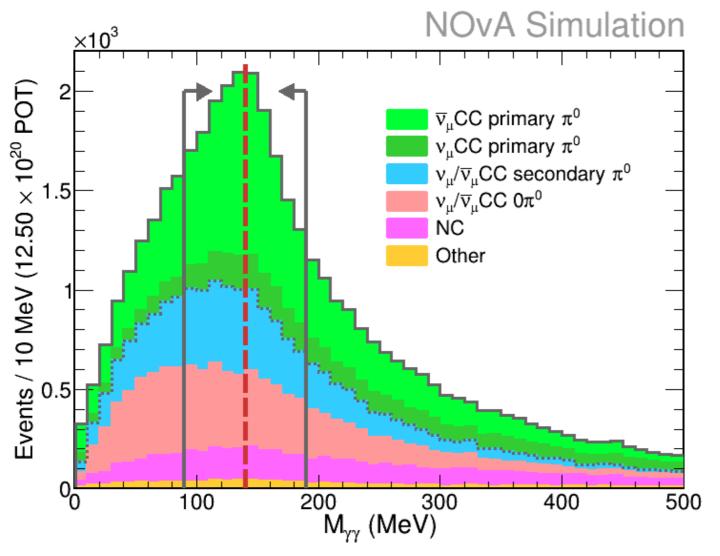
## **Sample Selection**

- **Prong 1 & 2**: Two candidate EM-like prongs in  $\bar{\nu}_{\mu}$ CC preselection sample
  - Identify muon-like prong
  - Select two candidate EM-like prongs with highest CNN EM scores
    (Prong 1 CNN EM score > Prong 2 CNN EM score)
  - Background reduction cut (muon kinetic energy cut) and prong quality cuts applied



#### **Invariant Mass Distribution**

$$m_{\gamma\gamma} = \sqrt{2E_{\gamma_1}E_{\gamma_2}(1-\cos\theta_{\gamma\gamma})}$$



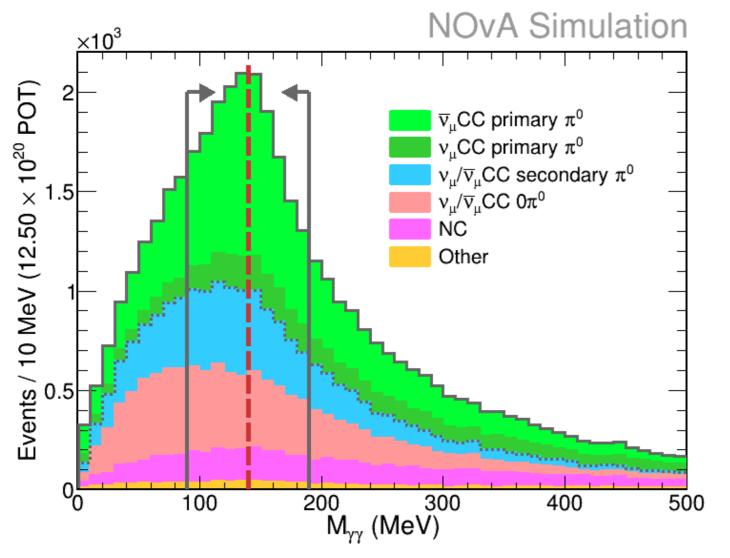
- Signal  $-\bar{\nu}_{\mu}/\nu_{\mu}$ CC with primary  $\pi^{0}$
- $CC\pi^0$  Background  $-\bar{\nu}_{\mu}/\nu_{\mu}CC$  with secondary  $\pi^0$
- Non-CC or Non- $\pi^0$  Background  $-\bar{\nu}_\mu/\nu_\mu$ CC without  $\pi^0$ 
  - $-\dot{N}C$
  - Other

• Invariant mass peak cut — [90, 190] MeV

| All Simulated Signal | Selected Events | Selected Signal | Efficiency | Purity |
|----------------------|-----------------|-----------------|------------|--------|
| 1.564e6              | 18008           | 8736            | 0.56%      | 48.5%  |

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- Non-CC or Non- $\pi^0$  Background  $-\bar{\nu}_{\mu}/\nu_{\mu}$ CC without  $\pi^0$  NC Other

#### **Template fit!**

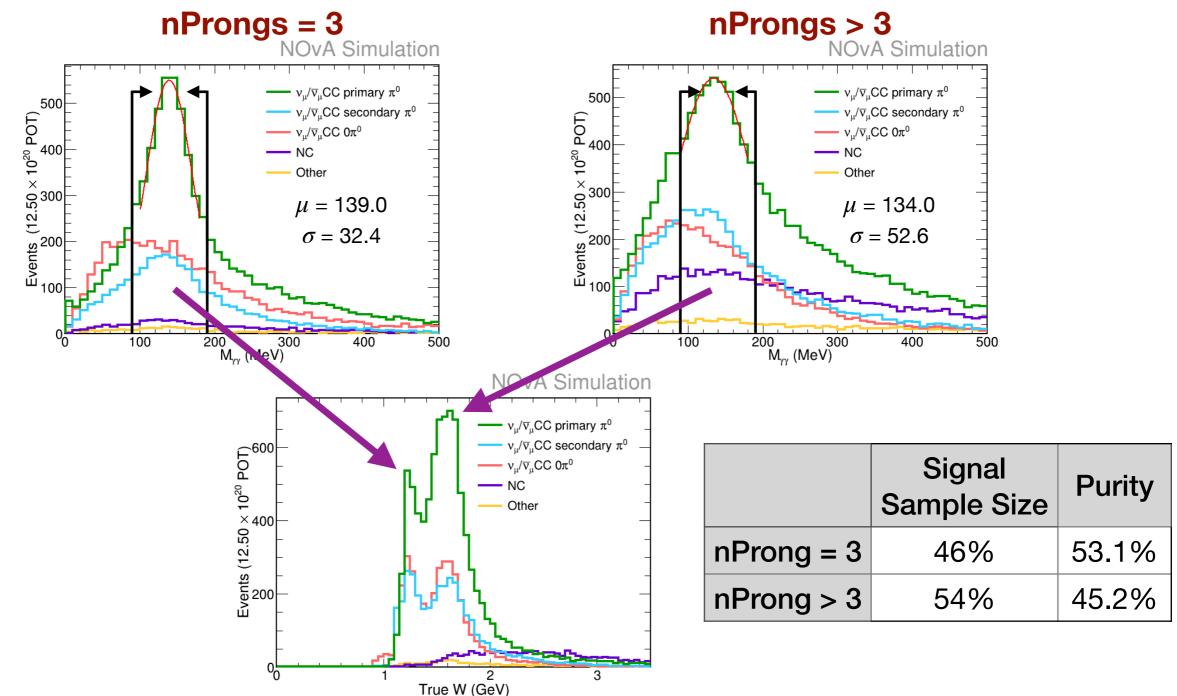
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## **Number of Prongs Cut**

Number of prongs cut splits selected sample into two orthogonal samples:
 nProngs = 3 & nProngs > 3, corresponding to two average W values





## **Background Estimation**

Data-driven **template fit**: Estimate  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^{0}$  and NC backgrounds.

#### • 4 sidebands:

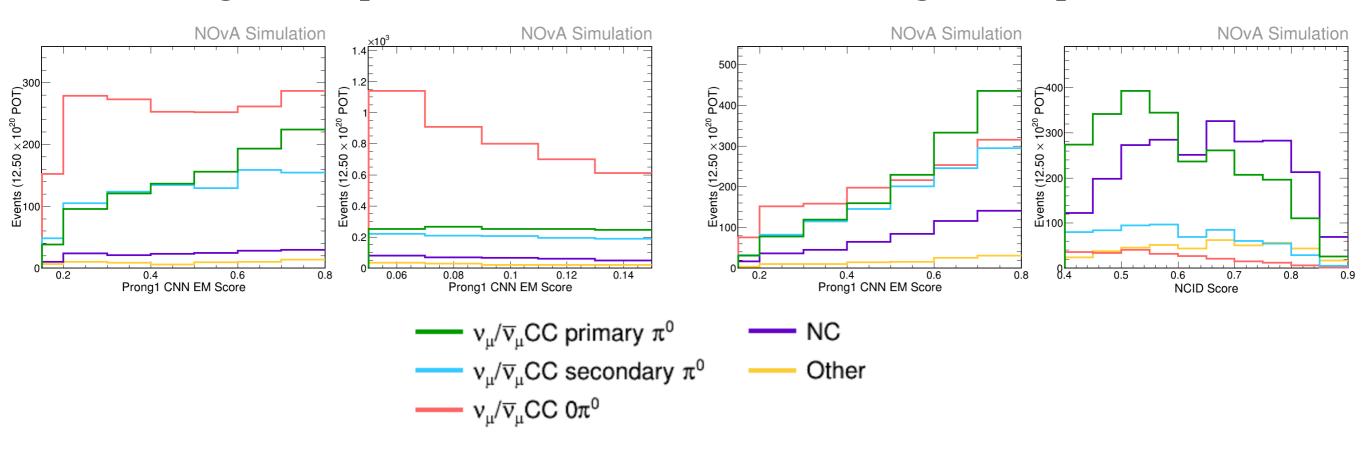
nProngs = 3:  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^0$ -1 sideband,  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^0$ -2 sideband nProngs > 3:  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^0$ -1 sideband, NC sideband

#### • Templates:

- $-\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^{0}$  sidebands template: Prong1 EM CNN Score
- NC sideband template: A Boosted Decision Tree (BDT) trained score (NCID)

#### **nProngs** = 3 sample sidebands

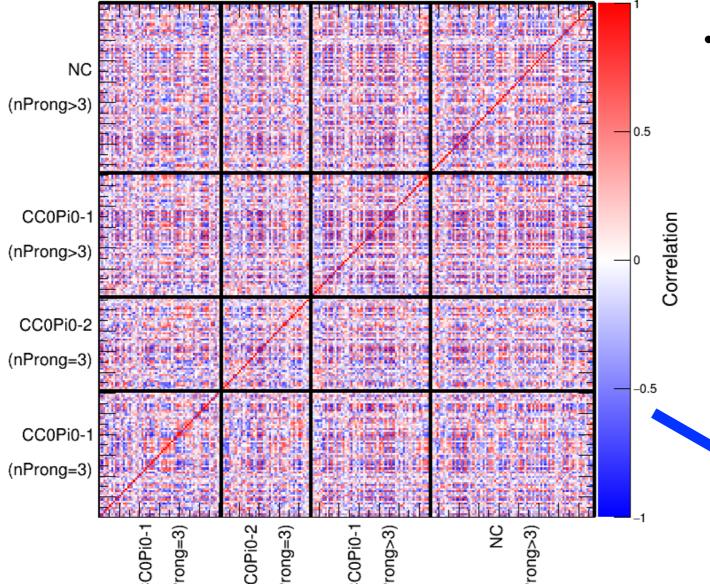
#### nProngs > 3 sample sidebands



## **Background Estimation**

Data-driven **template fit**: Estimate  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^0$  and NC backgrounds.

- Project each kinematic bin down to the template distributions broken down by signal and background components across all sidebands.
- Construct covariance matrix V, where  $V = V_{stat} + V_{syst}$



 Globally fit template normalization parameters by minimizing

$$\chi^2 = (x - \mu)^T V^{-1} (x - \mu)$$

#### correlation matrix

"normalized" covariance matrix

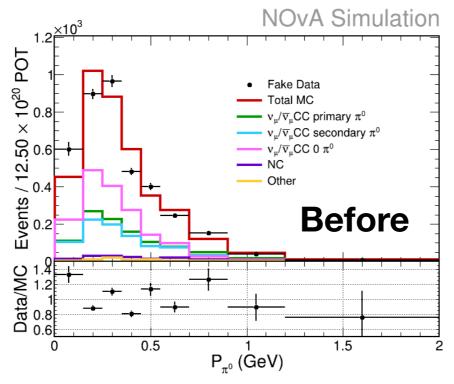
#### **Fake Data Fit Results**

#### nProngs = 3

#### **Fake Data:**

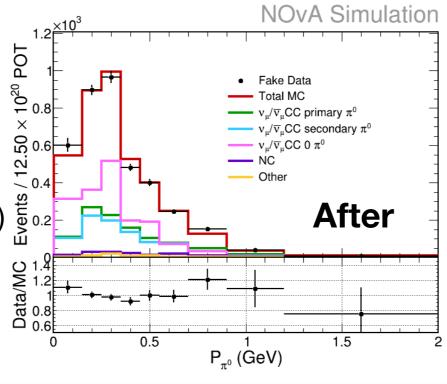
Adjust  $\bar{\nu}_{\mu}/\nu_{\mu} CC \ 0\pi^{0}$  normalizations up or down by 20% in alternating bins

#### $\bar{\nu}_{\mu}/\nu_{\mu} \text{CC } 0\pi^0$ - 1 Sideband

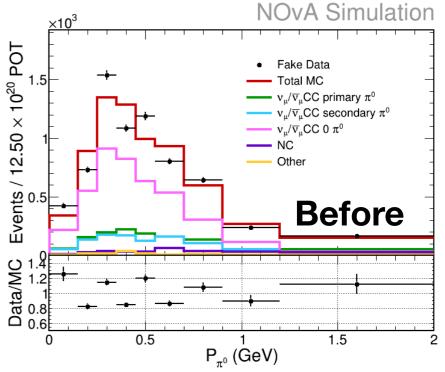


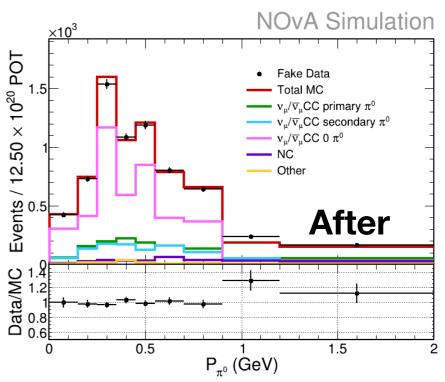
Fitting  $\chi^2$ :

525 (Before)  $\rightarrow$  260 (After)



#### $\bar{\nu}_{\mu}/\nu_{\mu} \text{CC } 0\pi^0$ - 2 Sideband





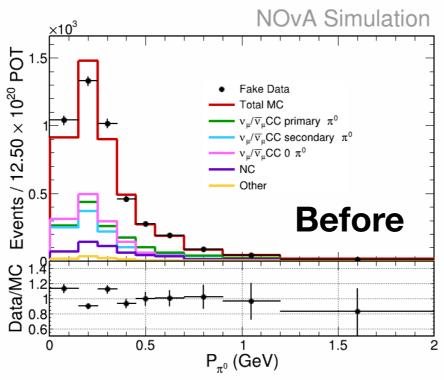
#### **Fake Data Fit Results**

#### nProngs > 3

#### **Fake Data:**

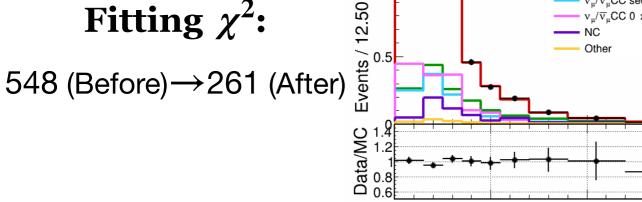
Adjust  $\bar{\nu}_{\mu}/\nu_{\mu} CC 0\pi^{0}$ and NC normalizations up or down by 20% in alternating bins

#### $\bar{\nu}_{\mu}/\nu_{\mu} CC 0\pi^0$ - 1 Sideband

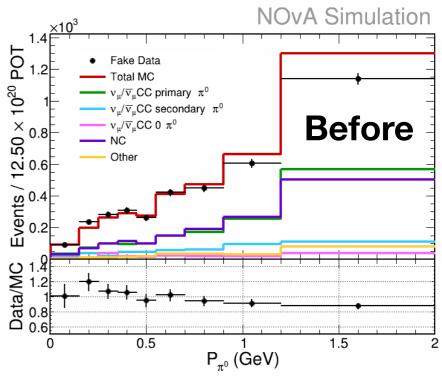


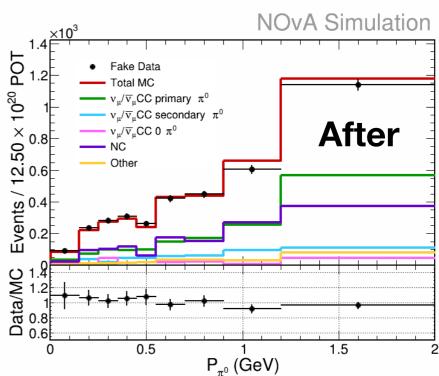
## Events / 12.50 × 10<sup>20</sup> POT $v_{\mu}/\overline{v}_{\mu}CC$ primary $\pi^{0}$ $v_{\mu}/\overline{v}_{\mu}CC$ secondary $\pi^{0}$ $v_{\parallel}/\overline{v}_{\parallel}CC \ 0 \ \pi^{0}$

0.5



#### **NC Sideband**





**NOvA Simulation** 

**After** 

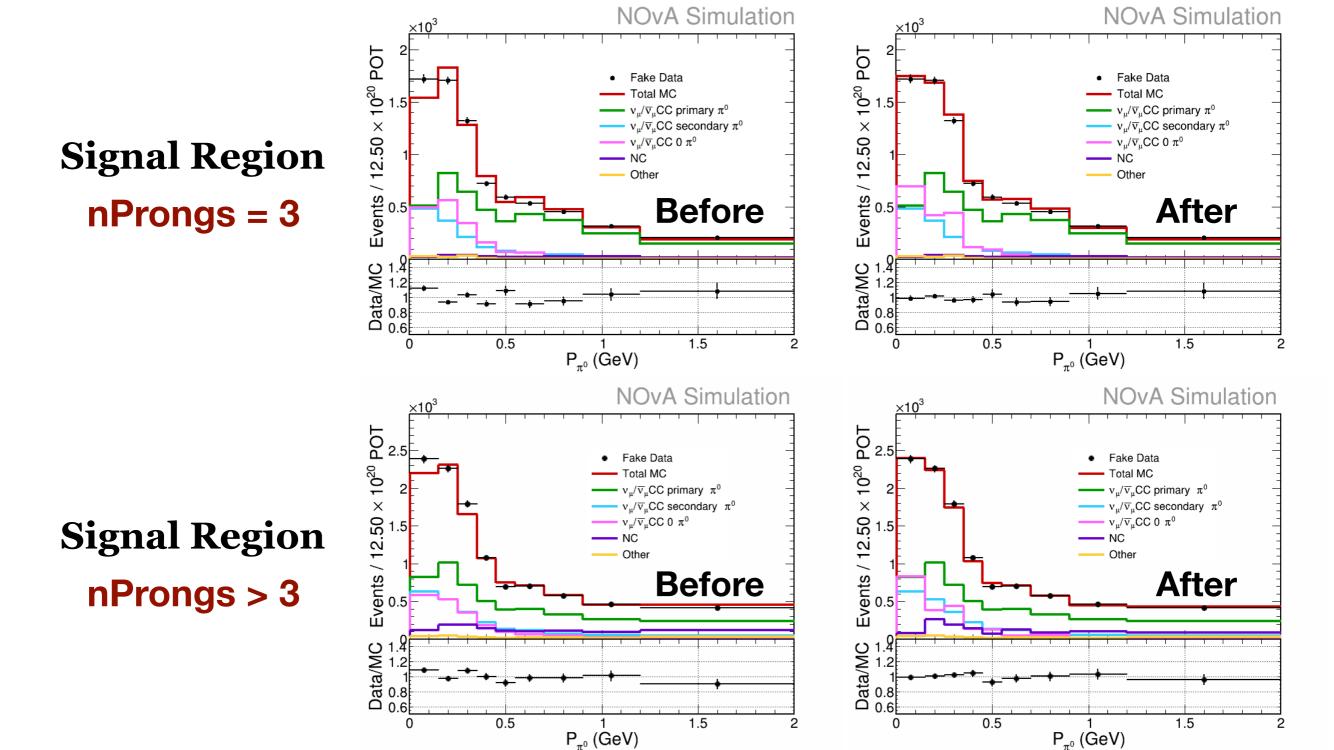
1.5

Fake Data

 $P_{\pi^0}$  ( $\dot{G}eV$ )

#### **Fake Data Fit Results**

• The template fit can be extended to estimate background in **signal region**.



#### Conclusion

- The high statistics antineutrino mode data in the NOvA Near Detector can be used to perform a measurement of the cross section of the  $\bar{\nu}_{\mu} CC\pi^0$  in the resonance regime.
  - Differential cross-section measurement with respect to  $\pi^0$  momentum and angle.
- CNN has been developed for EM shower selection.
  - Uses single particle prongs for training.
- A data-driven template fit has been developed to estimate  $\bar{\nu}_{\mu}/\nu_{\mu}$ CC  $0\pi^0$  and NC backgrounds using sidebands.
- Finalizing unfolding and systematic uncertainty estimation.

## Expect results soon!



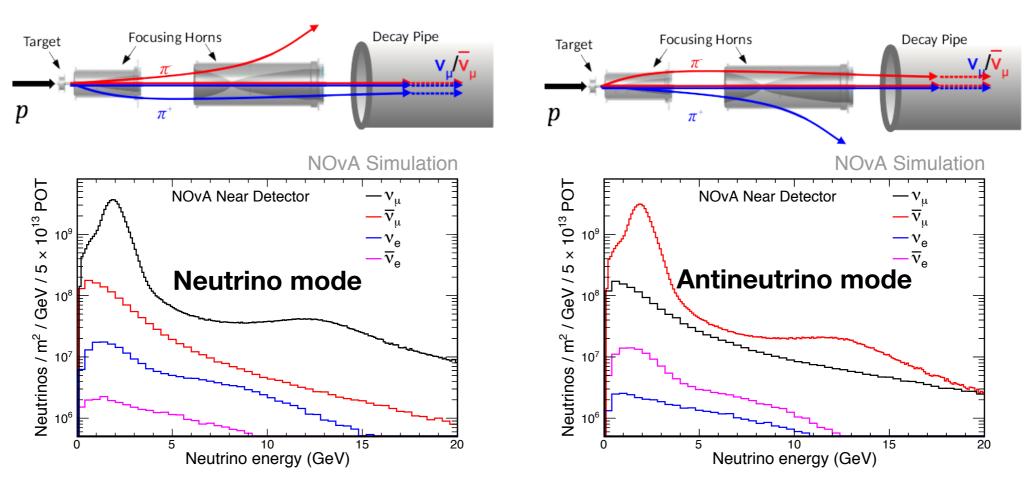
NOvA Collaboration, June 2022 @ Duluth, MN

# Thank you!

# Backup

#### **NOvA Flux at Near Detector**

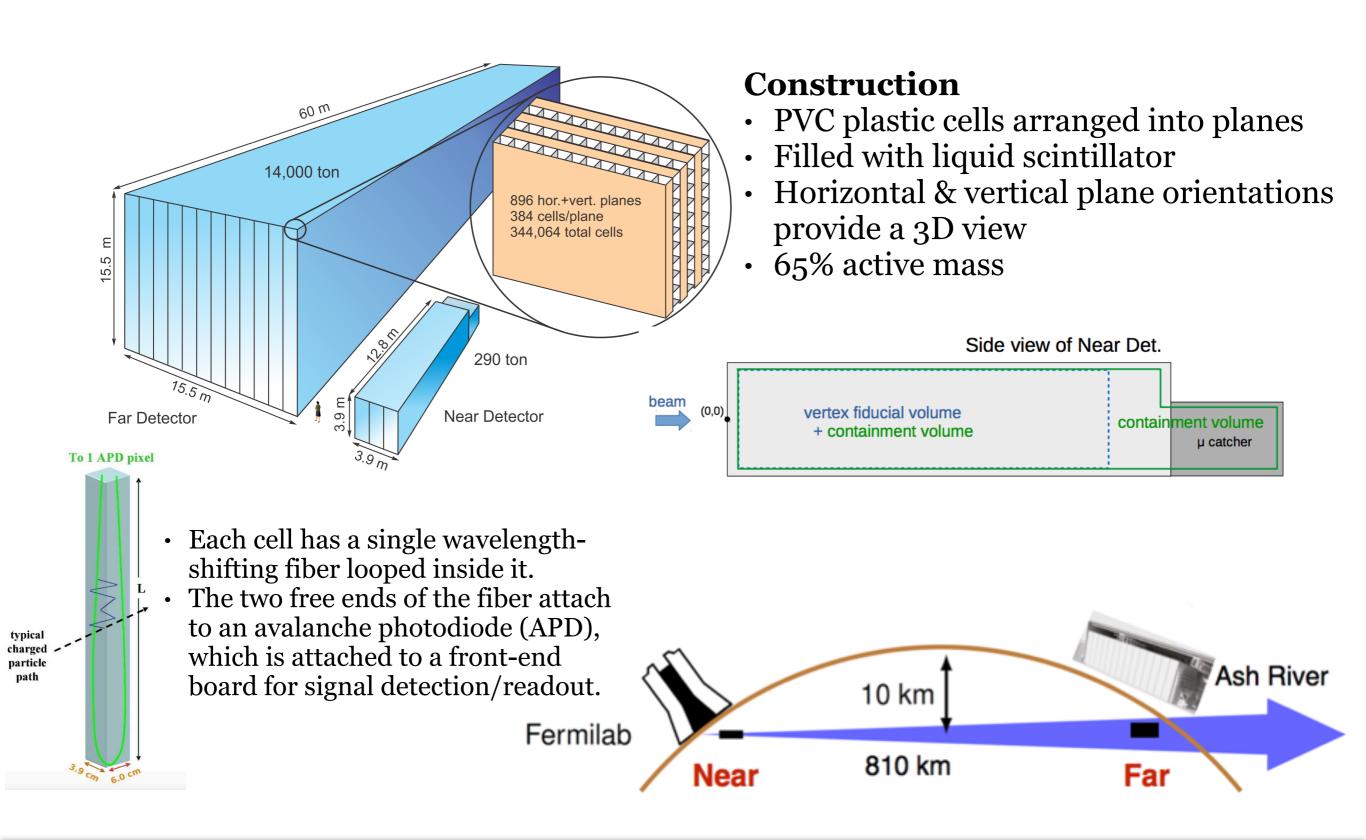
- Forward Horn Current (FHC) configuration focuses positively charged particles that decay to produce neutrinos.
- **Reverse Horn Current (RHC)** configuration focuses negatively charged particles that decay to produce antineutrinos.



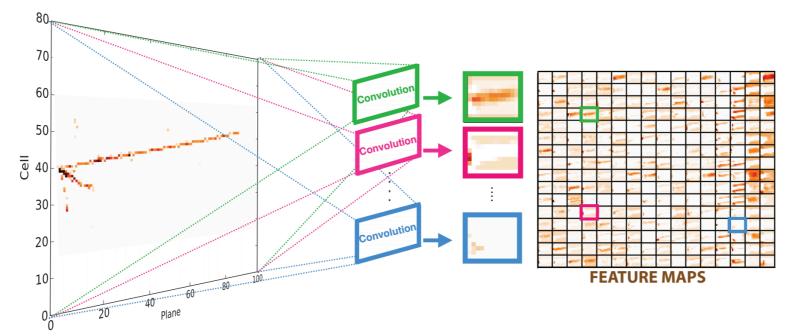
Integrated in [1, 5] GeV neutrino energy,

- The FHC beam contains 93.8%  $\nu_{\mu}$  with 5.3%  $\bar{\nu}_{\mu}$  and 0.9%  $\nu_{e}/\bar{\nu}_{e}$ .
- The RHC beam contains 92.5%  $\bar{\nu}_{\mu}$  with 6.6%  $\nu_{\mu}$  and 0.9%  $\nu_{e}/\bar{\nu}_{e}$ .

#### **NOvA Detectors**



## **NOvA Event/Particle Classification**



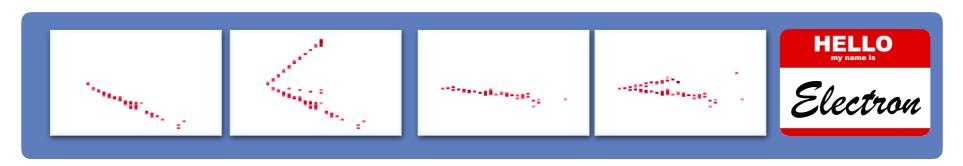
"A Convolutional Neural Network Neutrino Event Classifier" A. Aurisano, A. Radovic, and D. Rocco *et al*Journal of Instrumentation, Volume 11, September 2016

#### Convolutional Neural Network (CNN)

- Convolutional Visual Network (CVN) in NOvA
- Event Classification: Convolutions are applied to **pixel maps** of the events, which are trained to identify particular features (tracks, vertex, showers, etc.). Output of this process is a score by category.
- Particle Identification: Identify individual particles within an interaction event, using the full event topology for context.

## **Addressed Training Bias Issue**

• The original Particle-CNN used in oscillation analysis has been trained on both views (XZ-view & YZ-view) of the particle and both views of the entire event, which has bias from neutrino interaction model.



- We had to develop an unbiased training sample for this cross-section measurement.
- Single particle simulation sample was chosen.
  - $-e, \gamma, \pi^{\pm}, p, \mu$
  - Uniform distribution in momentum, angle, generated position

#### Why is this better?

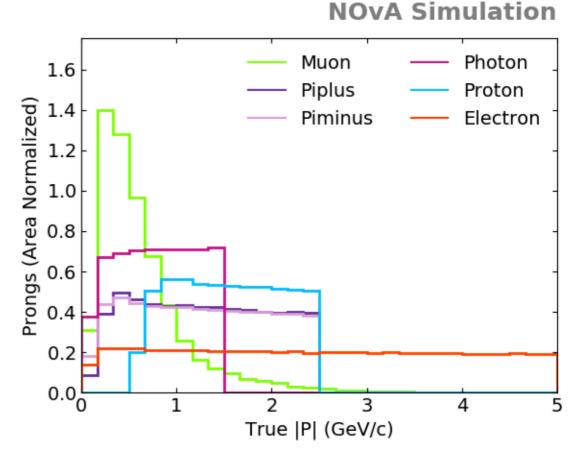
- Neutrino interaction model information is removed from training
- Information about kinematic distribution for final state particles are removed.

#### **NOvA Particle Identification**

- Single particle simulation sample was chosen for training.
  - $-e, \gamma, \pi^{\pm}, p, \mu$
  - Uniform distribution in momentum, angle, generated position
- Binary classification for prongs: Electromagnetic-like (EM-like) vs. non-EM-like
  - Equal fraction of EM sample and non-EM sample  $(\gamma + e)$  vs.  $(p + \pi^{\pm})$
  - $-\mu$  excluded from training

#### Cuts applied on trained prongs:

- Prong length ≤ 500 cm
- Prong is produced by generated particles
- Most energetic prong
- Prong is contained in the detector
- Prong quality cut: number of hit  $\geq 4$



## **Sample Selection**

#### **Preselection**

- Slice quality cut
- Fiducial volume cut Event vertex in fiducial volume
- Tracks/Showers containment cut All tracks/showers contained, only primary muon track can be in muon catcher
- Muon ID cut

#### **Candidate Events Selection**

- 3 or more prongs
  - Muon-like prong: Most collinear with primary muon track
  - Two candidate EM-like prongs: Highest CNN EM scores

#### **Background Reduction Cuts**

- Muon kinetic energy cut  $KE\mu > 0.4 \text{ GeV}$
- Prong quality cuts Two candidate EM-like prongs

Prong 1  $N_{hit} \ge 6$ , Prong 2  $N_{hit} \ge 4$ 

## Sources of Systematic Uncertainties

- Neutrino cross-section systematics
- Particle tracking cross-section systematics
  - Mainly come from  $\pi^{\pm} \to \pi^0$  when propagating though the detector (the source of secondary  $\pi^0$  background)
- Flux modeling systematics
  - Hadron production in the NuMI target (large)
  - Beam transport
- Detector response systematics
  - Simulated light level (large)
  - Absolute calibration
  - Attenuation calibration

• .....